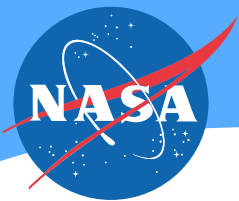




Standardizing the GRACE/GRACE-FO ASCII products with YAML encoding

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Focuses

1. Motivations for standardizing the GRACE/GRACE-FO ASCII products.
2. Objectives for ASCII File Header Redesign –
 - Improve the metadata
 - Standard ASCII formats.
3. Why adopt the YAML format?
4. YAML File Structure -- Header and Data-Block.
5. Compare YAML header with original.
6. Working with YAML in Python
7. Converting legacy data-block into YAML format.

Motivations for standardizing ASCII files



1. Meeting NASA requirements

- a. NASA satellite missions should follow the [NASA Earth Science Data Preservation Content Specification](#), including metadata, and data format.
- b. ESO (ESDIS Standards Office) assists the [Earth Science Data and Information System \(ESDIS\) Project](#) in formulating standards policy for NASA [Earth Science Data Systems \(ESDS\)](#)
- c. ESO has approved [ASCII File Format Guidelines for Earth Science Data](#) and required that all ASCII files should be in compliance with this Guidelines.

2. Standards Improve the GRACE product accessibility and interoperability, making the products FAIR (Findable, Accessible, Interoperable, Reusable)

- a. Standards increase the data visibility. Standard product names and keywords make the data more Findable
- b. Make the data more accessible, facilitating data modeling and development of service tools.
- c. Standards enable data interoperability, data sharing and maximize the data usage
- d. Increase the data sustainability and reusability.

Objectives for File Header Redesign -- Improve the metadata



1. **Improve data file metadata**

- Metadata is the core of the data management lifecycle.
- Richer metadata improves the data discoverability and accessibility.
- Richer metadata facilitates the communication between different communities.
- Metadata is a key measure of data quality.

2. **Increase data interoperability**

- Standards enable the interoperability.
- Adopting the NASA-endorsed metadata standards as summarized by PO.DAAC metadata best practices.
- Climate Forecast (CF), Attribute Conventions for Data Discovery (ACDD) and International Standards Organization (ISO) conventions.

Objectives for File Header Redesign -- Standard ASCII format



3. Header should be user-friendly, self-explanatory

- Easy to read and understand the metadata for all users.
- Make the data functionally usable and sustainably reusable.
- Retain legacy information from the original header.

4. Header structure syntax should be simple

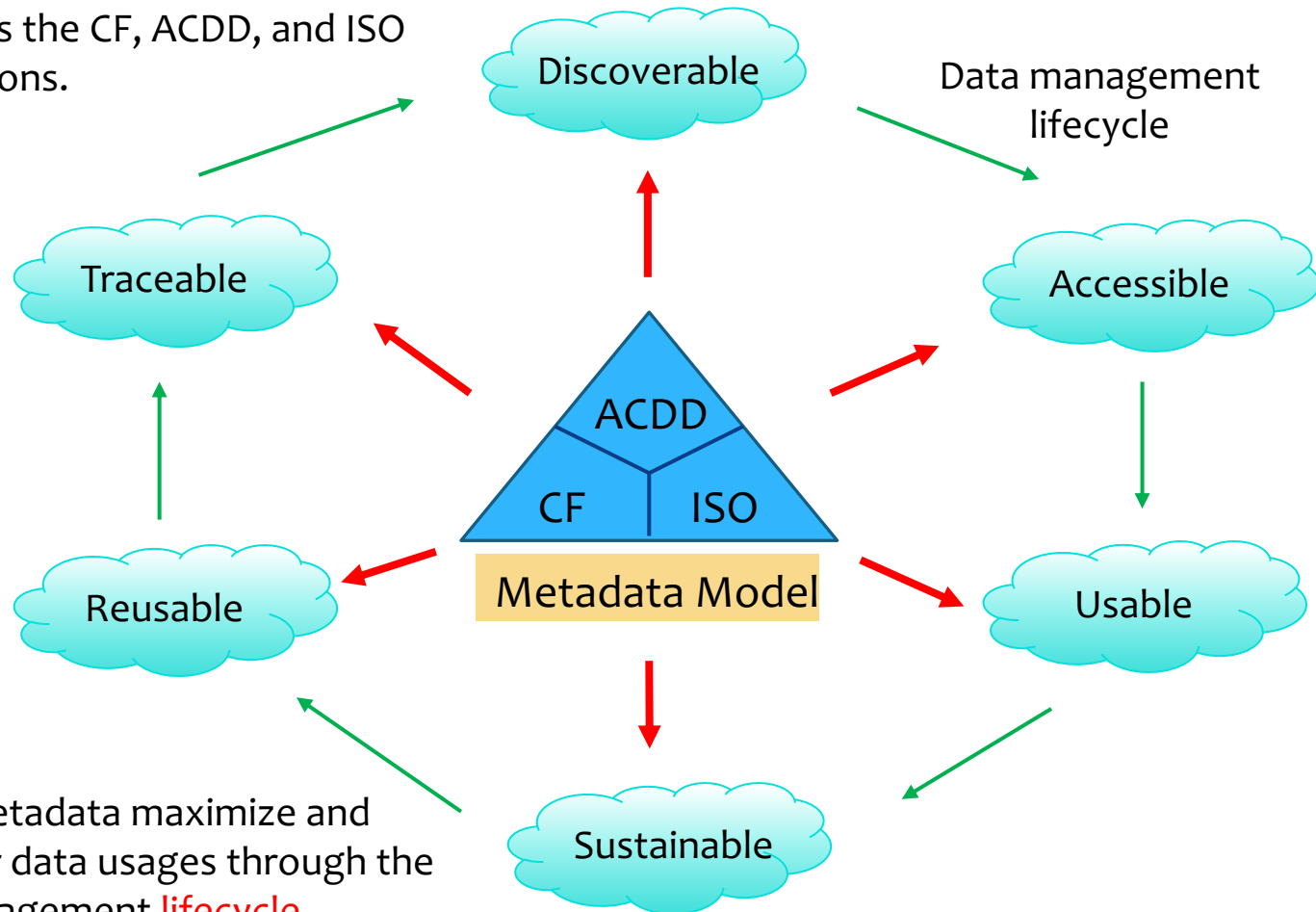
- Minimize the effort to implement.
- Increase header readability.

5. ASCII file is readable by most common programming languages for data I/O across programs on different platforms.

- C/C++, Python, R, Matlab, IDL, Java, Perl, Ruby, PHP, C#.

PO.DAAC Data management vs Metadata Model

- PO.DAAC metadata model combines the CF, ACDD, and ISO conventions.



- Richer Metadata maximize and empower data usages through the data management **lifecycle**.



Why Adopt the YAML format?

- * **YAML encoding is one of the ESDSWG recommended ASCII data formats**

1. netCDF's NcML (XML representation of netCDF).
2. netCDF CDL (Common Data Form Language) Text representation of netCDF
3. JSON (JavaScript Object Notation)
4. **YAML** (YAML Ain't Markup Language)
5. ICARTT () designed for airborne mission ASCII data.

- * **Why choose YAML**

1. Designed to be human-friendly data serialization language.
2. Easier to read and write than other common data formats
3. YAML syntax are simple, clear, and easy to implement
4. YAML can work with many modern programming languages, including C/C++, Python, Java, Perl, PHP, Ruby, C#.
5. Very similar to original header structure.

- * **YAML vs JSON**

1. YAML is closely related with JSON, but simpler.
2. Technically, YAML is a superset of JSON.
3. YAML and JSON can be easily converted.



YAML Header Structure

- * **Header contains four sections**

1. **dimensions**

- Define the spatial and temporal dimensionality, Lat, Lon, and Time
- In GRACE, it refers to degree and order

2. **global_attributes**

- Cover most common standard attributes defined in the NASA standard metadata model

3. **non-standard_attributes** (project_attributes)

- Project specific global attributes

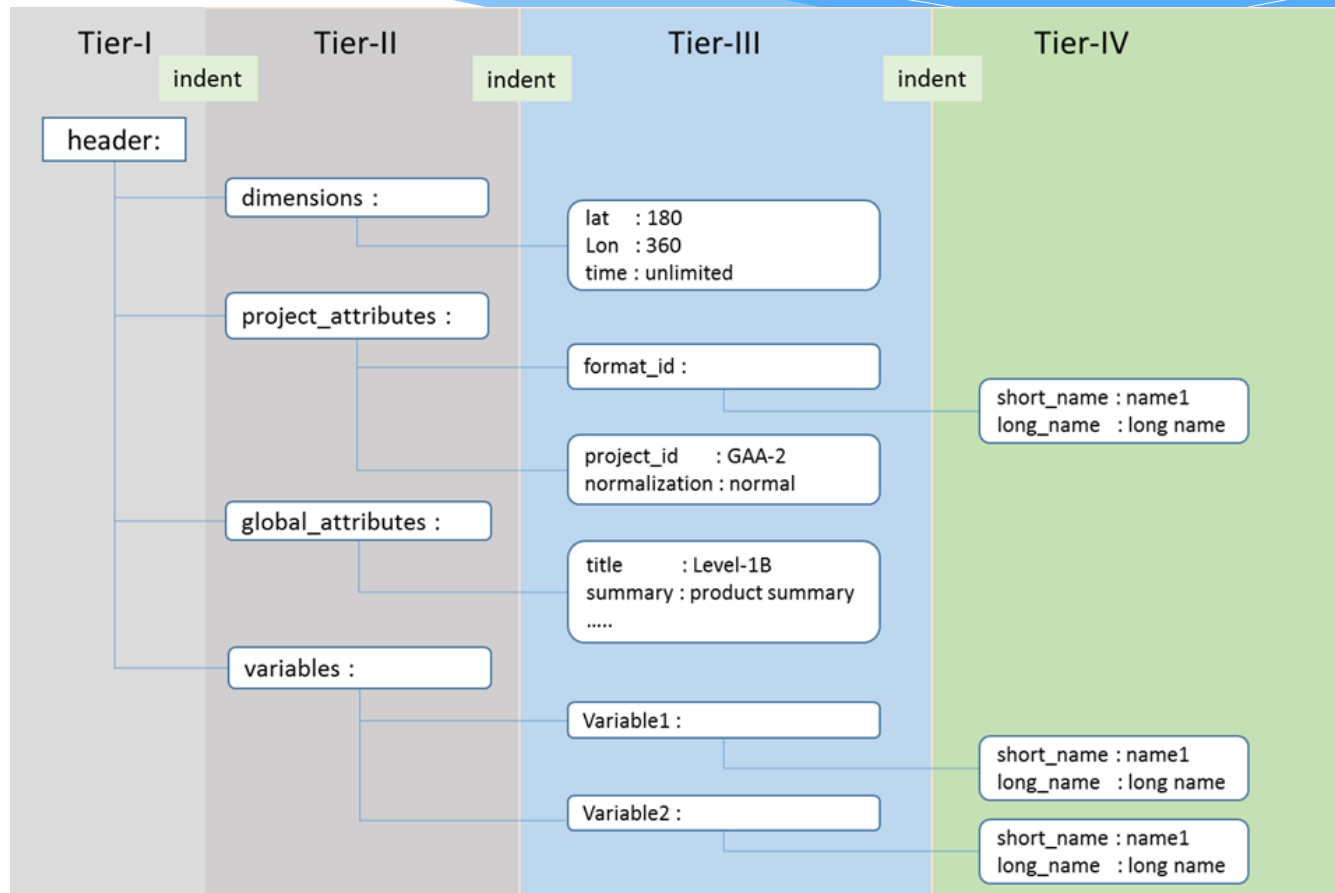
4. **variables**

- Define data name (standard and long), property for each column.

- * **Header contains multiple nested structures (Dictionary in Python)**

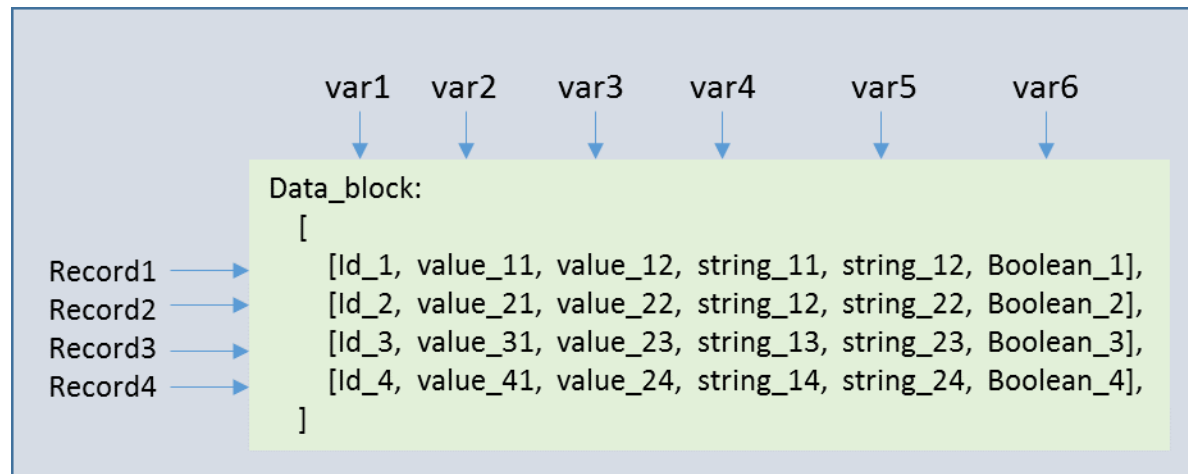
- * **YAML header interface is much like CDL (Common Data form Language) format, which is a human-readable text representation of netCDF data.**

Diagram of YAML Header



Standard Data-block design

- Each variable takes a single column
- Each data record takes a single row
- Variable values in each row are separated by comma, and closed with square bracket ([]).
- The data-block should be a 2-D Array/List



Published GRACE Level-2 RL06 products in YAML format



- * Recently released the GRACE Level-1/Level-2 RL06 products in YAML format.
- 1. GRACE_GAA_L2_GRAV_GRZ_RL06 (JPL,GFZ)
- 2. GRACE_GAB_L2_GRAV_GRZ_RL06 (JPL,GFZ)
- 3. GRACE_GAC_L2_GRAV_GRZ_RL06 (JPL,GFZ, CDR)
- 4. GRACE_GAD_L2_GRAV_GRZ_RL06 (JPL,GFZ, CDR)
- 5. GRACE_GSM_L2_GRAV_GRZ_RL06 (JPL,GFZ, CDR)

YAML (rlo6) vs original header(rlo5)

(GAA-2_2003032-2003059_GRAC-JPLEM_BC01_0600)_



FIRST GAA-2_2003032-2003059_0025_JPLEM_0000_0005 SHM JPL/NASA/USA 20120905
CMMN3 Beginning epoch :20030201.0000
CMMNT Center epoch :20030215.0000
CMMN4 Ending epoch :20030301.0000
CMMN5 The 0th and 1st degree terms are excluded from JPL level-2 processing
CMMN6 Unused days (date) : 08-FEB-2003
CMMN6 Unused days (date) : 20-FEB-2003
CMMN6 Unused days (date) : 26-FEB-2003
EART73.9860044150e+186.37813646

Original RLO5 Header

header:
dimensions:
degree : 180
order : 180
non-standard_attributes:
product_id : GAA-2
format_id :
1 short_name : SHM
long_name : Earth Gravity Spherical Harmonic Model Format
normalization : fully normalized
earth_gravity_param :
long_name : gravitational constant times mass of Earth
units : m3/s2
value : 3.9860044150e+14 7
mean_equator_radius :
long_name : mean equator radius
units : meters
value : 6.3781363000e+06 8
5 comments : Degree 0 and Degree 1 terms are excluded from JPL Level 2 Processing

YAML RLO6 Header

global_attributes:
title : AOD1B ATM Coefficients JPL RLO6
summary :
Spherical harmonic coefficients that represent anomalous contributions of the non-tidal atmosphere to the Earth's mean gravity field during the specified timespan. This includes the contribution of atmospheric surface pressure over the continents, the static contribution of atmospheric pressure to ocean bottom pressure elsewhere, and the contribution of upper-air density anomalies above both the continents and the oceans. The anomalous signals are relative to the mean field from 2003-2014.
project : NASA Gravity Recovery And Climate Experiment (GRACE)
program : NASA Earth Science System Pathfinder
keywords : GRACE, Level-2, SHM, Spherical Harmonic Model, Gravitational Field, GSM, Geopotential, Gravity Field, Mass, Mass Transport, Total Water Storage, Time Variable Gravity, Mass Balance, Gravity Anomaly, Satellite Geodesy, Atmosphere, Non-Tidal Atmosphere, AOD, Dealiasing Product
keywords_vocabulary : NASA Global Change Master Directory (GCMD) Science Keywords
institution : NASA/JPL
conventions : CF-1.6, ACDD-1.3, ISO 8601
id : 10.5067/GRGAA-20106
naming_authority : org.doi.dx
history : Original solution produced on 2018-05-19T08:41:19
source : All data from AOD1B RLO6
processing_level : 2
acknowledgement :
GRACE is a joint mission of NASA (USA) and DLR (Germany). Use the digital object identifier provided in the id attribute when citing this data. See <https://podaac.jpl.nasa.gov/CitingPDAAC>
license :
product_version : 6.0
references : ftp://podaac-ftp.jpl.nasa.gov/allData/grace/docs/AOD1B_PDD_RLO6_v6.0.pdf
creator_name : GRACE Science Data System NASA/JPL
creator_email : grace@podaac.jpl.nasa.gov
creator_url : <https://grace.jpl.nasa.gov>
creator_type : group
2 creator_institution : NASA/JPL
publisher_name : Physical Oceanography Distributed Active Archive Center
publisher_email : podaac@jpl.nasa.gov
publisher_url : <https://podaac.jpl.nasa.gov>
publisher_type : group
3 publisher_institution : NASA/JPL
time_coverage_start : 2003-02-01T00:00:00.00
time_coverage_end : 2003-02-28T23:59:59.00
4 unused_days : [2003-02-08, 2003-02-20, 2003-02-21, 2003-02-26]
date_created : 2018-05-19T08:41:19
date_issued : 2018-05-19T08:41:19

variables:

ECM Coefficient Record 2
variables:
record_key:
key_name : GRACO2
long_name : Earth Gravity Spherical Harmonic Model Format Type
coverage_content_type : referenceinformation
data_type : string
comment : 1st column
degree_index:
long_name : spherical harmonic degree l
coverage_content_type : referenceinformation
data_type : int32
comment : 2nd column
order_index:
long_name : spherical harmonic order m
coverage_content_type : referenceinformation
data_type : int32
comment : 3rd column
clm:
long_name : Clm coefficient; cosine coefficient for degree l and order m
coverage_content_type : modelResult
data_type : double precision
comment : 4th column
slm:
long_name : Slm coefficient; sine coefficient for degree l and order m
coverage_content_type : modelResult
data_type : double precision
comment : 5th column
clm_std_dev:
long_name : standard deviation of Clm
coverage_content_type : qualityinformation
data_type : double precision
comment : 6th column
slm_std_dev:
long_name : standard deviation of Slm
coverage_content_type : qualityinformation
data_type : double precision
comment : 7th column
epoch_begin_time:
long_name : epoch begin of Clm, Slm coefficients
time_format : yyyyymmdd.hhmm
coverage_content_type : referenceinformation
data_type : string
comment : 8th column
epoch_stop_time:
long_name : epoch stop of Clm, Slm coefficients
time_format : yyyyymmdd.hhmm
coverage_content_type : referenceinformation
data_type : string
comment : 9th column
solution_flags:
long_name : Coefficient adjustment and a priori flags
coverage_content_type : auxiliaryinformation
data_type : byte
flag_meanings :
- char 1 = Clm adjusted, y for yes and n for no
- char 2 = Slm adjusted, y for yes and n for no
- char 3 = stochastic a priori info for Clm, y for yes and n for no
- char 4 = stochastic a priori info for Slm, y for yes and n for no
comment : 10th column
solution_comment:
long_name : Comment when present
coverage_content_type : referenceinformation
data_type : string
comment : 11th column
End of YAML header

Working with YAML in Python

* Open/read YAML file

```
1 > import yaml
2 > stm = open("full_path/filename.yaml", 'r')
3 > data = yaml.load(stm)
```

* Output YAML file

```
1 > out = open("full_path/filename.yaml", 'w')
2 > yaml.dump(data, out, indent = 4, default_flow_style=False)
```

* Convert YAML to JSON

* YAML is superset of JSON

```
1 > import sys
2 > import json
3 > with open('outfile.json', 'w') as out1:
    json.dump(data, out1, indent=4, separators=(',', ': '))
```

Working with YAML in Python

- * **Extract the metadata information**

- * Following the nested structure down to the element

```
1 > undays = data['header']['global_attributes']['unused_days'][0]
2 > print ('Unused_days =', undays)
3 > Unused_days = 2003-02-08
```

- * **Extract the data record values**

- * Depend on the data-block structure
- * Standard data-block

```
1 > data['datablock2'][0][3]    # value at 1st row and 4th col
2 > -1.00683e-11                # result
```

Convert Legacy GRACE data-block to YAML format compatible.



- ❑ GRACE legacy data-block remain unchanged in current YAML ASCII files.
- ❑ Converted to YAML format by adding three lines of simple codes.

3.2.2 GRACE legacy data-block:

```
GRCOF2 0 0 -1.0068e-11 0.0000e+00 0.0000e+00 0.0000e+00 20030201.0000 20030301.0000 nnnn
GRCOF2 1 0 -2.6640e-11 0.0000e+00 0.0000e+00 0.0000e+00 20030201.0000 20030301.0000 nnnn
GRCOF2 1 1 3.5867e-11 7.1248e-11 0.0000e+00 0.0000e+00 20030201.0000 20030301.0000 nnnn
GRCOF2 2 0 6.0144e-11 0.0000e+00 0.0000e+00 0.0000e+00 20030201.0000 20030301.0000 nnnn
GRCOF2 2 1 7.6731e-12 3.949e-11 0.0000e+00 0.0000e+00 20030201.0000 20030301.0000 nnnn
GRCOF2 2 2 -3.702e-12 1.8947e-11 0.0000e+00 0.0000e+00 20030201.0000 20030301.0000 nnnn
```

3.2.3 Convert to YAML formatted data-block:

Data-block :

```
[
GRCOF2 0 0 -1.0068e-11 0.0000e+00 0.0000e+00 0.0000e+00 20030201.0000 20030301.0000 nnnn
GRCOF2 1 0 -2.6640e-11 0.0000e+00 0.0000e+00 0.0000e+00 20030201.0000 20030301.0000 nnnn
GRCOF2 1 1 3.5867e-11 7.1248e-11 0.0000e+00 0.0000e+00 20030201.0000 20030301.0000 nnnn
GRCOF2 2 0 6.0144e-11 0.0000e+00 0.0000e+00 0.0000e+00 20030201.0000 20030301.0000 nnnn
GRCOF2 2 1 7.6731e-12 3.949e-11 0.0000e+00 0.0000e+00 20030201.0000 20030301.0000 nnnn
GRCOF2 2 2 -3.702e-12 1.8947e-11 0.0000e+00 0.0000e+00 20030201.0000 20030301.0000 nnnn
]
```

Extract the data value

- * Extract the value from the data-block at any given location
- * Parsing is a little complicated

```
1  > coef = data['grace_data']    # assign the grace data to coef
2  > nList = coef[0].split()      # split the single string with space
3  > print(nList[3])              # print value at 1st row and 4th col
4  > -1.00683e-11                 # result
```




Thank You